PET-BIDS, an extension to the brain imaging data structure for positron emission tomography

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42 ABSTRACT

The Brain Imaging Data Structure (BIDS) is a standard for organizing and describing neuroimaging datasets. It serves not only to facilitate the process of data sharing and aggregation, but also to simplify the application and development of new methods and software for working with neuroimaging data. Here, we present an extension of BIDS to include positron emission

⁴³ Interfolds and software for working with redroininging data. Field, we present an extension of BDS to include position emission tomography (PET) data (PET-BIDS). We describe the PET-BIDS standard in detail and share several open-access datasets curated following PET-BIDS. Additionally, we highlight several tools which are already available for converting, validating and analyzing PET-BIDS datasets.

44 Background & Summary

Positron Emission Tomography (PET) was developed in the late 1950s with the ultimate goal of measuring and visualizing 45 physiological processes in vivo such as metabolism, blood flow and the concentration of proteins in various receptor sys-46 tems¹⁻³. Since then, PET has been used extensively in pre-clinical and clinical settings, mostly for oncological purposes⁴, but 47 increasingly also in areas of cardiology and neurology (for investigation of, e.g., synaptic plasticity, neuroinflammation, and 48 neurodegeneration⁵). For brain imaging specifically, PET has largely been applied together with high affinity radiolabeled 49 molecules to quantify the brain's distribution, concentration and drug occupancy of proteins, using pharmacokinetic models⁶. 50 The outcomes of this work have provided significant insights into the complex neurobiology of receptor systems in the healthy 51 and diseased brain, as well as advancements in our understanding of pharmacological treatments⁶. However, compared to 52 imaging modalities such as structural Magnetic Resonance Imaging (MRI), experiments using PET often involve data from 53 multiple sources including, e.g., chemical characteristics of radiolabelled molecules and blood and metabolite data acquired 54 during the imaging procedure (Figure 1). The acquisition and availability of different types of data related to the PET experiment 55 depends on the biological target of interest, and complicates the standardization of the acquired data for storage, analysis and 56 sharing. Furthermore, due to differences in PET scanner vendors and blood sampling devices across PET centers, data are often 57 stored in different file formats, and with varying nomenclature describing the same type of data. Historically, the field of PET 58 brain imaging attained maturity with the adoption of a consensus nomenclature for pharmacokinetic modeling of PET data in 59 2007⁷. Recently in 2020, similar to the Organization for Human Brain Mapping recommendations from the Committee on Best 60 Practices in Data Analysis and Sharing (COBIDAS) for MRI and MEEG, consensus guidelines for describing the content and 61 format of PET brain data in publications and archives has emerged⁸. 62 The Brain Imaging Data Structure (BIDS) standard was originally developed for MRI as a community standard for organizing 63 and sharing brain imaging study data within and between laboratories⁹. While the focus was originally targeting MRI, and 64 especially structural and functional MRI (fMRI), BIDS has since rapidly expanded to include many different imaging modalities, 65 including magnetoencephalography (MEG)¹⁰, electroencephalography (EEG)¹¹, intracranial electroencephalography (iEEG)¹², 66 and linking brain imaging to genetics¹³. BIDS mainly addresses the heterogeneity of data organization by following the 67 FAIR principles (findability, accessibility, interoperability, and reusability)¹⁴. Findability and reusability are addressed in 68 BIDS by providing rich metadata in dedicated sidecar files. Interoperability is addressed by using the existing Neuroimaging 69 Informatics Technology Initiative (NIfTI) format for storing brain imaging data, text files arranged according to the JavaScript 70 Object Notation (JSON) format for complementary metadata, and Tab Separated Value (TSV) format for tabular data. While 71 accessibility is not directly addressed within the BIDS standard itself, the existence of such a standard facilitates the development 72 of public data repositories. The largest of these repositories, OpenNeuro (https://openneuro.org), is already built 73 around the BIDS standard, and a new repository fully dedicated to PET scans (OpenNeuroPET) is currently under development 74 (https://openneuro.org/pet). BIDS also fosters interoperability and reuse of already acquired data by defining how 75 to structure and store data using naming conventions and dedicated metadata files. Because BIDS data follow a common 76 data structure and description, the proliferation of BIDS datasets incentivizes the creation of analysis pipelines that target this 77 78 structure, the adoption of which promotes verifiable and reproducible research practices.

In this work, we present the main features of the extension of BIDS to include PET data (PET-BIDS). This extension largely
 builds upon the original BIDS specification⁹, and the guidelines for the content and format of brain PET data in publications
 and archives⁸. The full documentation of the PET-BIDS extension can be found in the general BIDS specification ¹.

82 PET-BIDS summary

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The extension of BIDS to include PET data largely aligns with the BIDS specification for other imaging modalities, describing a way for organizing PET data and specifying metadata for PET experiments. A rough overview of the directory structure is given in Figure 2, and a detailed example is given in Figure 3. Each subject's data corresponds to a directory which contains subdirectories for each acquisition session (e.g., *baseline*, *rescan* or *intervention*) and imaging modality (e.g., *pet*). The subdirectories are also accompanied by a dataset_description.json file containing generic information about the dataset, providing full credit to the authors sharing the data. Within each subject directory, the /pet subdirectory contains the PET imaging data and the corresponding metadata. PET imaging data are stored in 4D (or 3D if only one volume was acquired) NIfTI files with a _pet suffix. When acquiring several volumes (frames in PET terminology) these should be stored in 4D in chronological order (the order they were acquired in). The imaging data are accompanied by a _pet.json sidecar file which details the metadata of the PET acquisition. All the metadata are in accordance with the guidelines for the content and format

⁹³ of brain PET data⁸.

The file naming structure for PET data closely follows the general BIDS guidelines⁹, using specified key-value pairs joined by hyphens and separated by underscores. Multiple sessions (typically visits) are encoded by adding an extra layer

¹https://bids-specification.readthedocs.io/en/stable/

of directories in the form of ses-<label>. Hence, a single session study, sub-<label> would have a subdirectory 96 /pet which contains PET files using the naming pattern sub-<label>_ses-<label>_pet.nii[.gz] corresponding 97 to several acquisitions of PET data. The session label should be used in cases such as test-retest or baseline-intervention 98 setups. Additionally, a task-<label> can be inserted in a similar way as task-based and resting state Blood Oxygen Level 99 Dependent (BOLD) fMRI data in the existing BIDS standard. For example, in the case of studies using combined PET/fMRI, 100 subject-specific tasks may be carried out during the acquisition within the same session. Therefore, it is possible to specify 101 task-<label> in accordance with the fMRI data. Specifically for PET, multiple acquisitions per subject using different 102 tracers during the same session are possible and the trc-<label> must be used to distinguish between different tracers. 103 Please keep in mind that the label used is arbitrary and each file requires a separate JSON sidecar file with details of the 104 tracer used. Also, specifically for PET a reconstruction key rec-<label> can be used to distinguish different types of 105 reconstructions of the PET data. The rec-<label> has four reserved values: acdyn, for reconstructions with attenuation 106 correction of dynamic data; *acstat*, for reconstructions with attenuation correction of static data; *nacdyn*, for reconstructions 107 without attenuation correction of dynamic data; nacstat, for reconstructions without attenuation correction of static data. 108 Further information about the reconstruction should be added to the accompanying _pet.json metadata file. Finally, the 109 run-<index> can be used if one scan type/contrast is repeated multiple times within the same scan session/visit. For 110 example, for dynamic PET acquisitions, subjects may have to leave the scanner to use the bathroom. While leaving the scanner 111 would interrupt an MR acquisition, in PET this disruption is more appropriately considered missing data during a run, and the 112 acquisition would still be considered the same session/run. However, there are also cases of acquisitions where this definition 113 might not be entirely clear, and it will be up to the researcher to decide what makes most sense. For example, dual-time-window 114 acquisitions¹⁵ could be considered two runs within the same session, but it could also be considered a single run with missing 115 data between the two time windows. 116

117 Blood data availability

If blood data are available, such as arterial or venous samples acquired during the PET experiment, they are stored in the 118 /pet folder alongside the corresponding PET data (Figure 3). Blood can be sampled by an autosampler, for continuous 119 monitoring of whole blood radioactivity, and/or manually drawn for discrete blood samples. Therefore, the recording key 120 recording-<label> for blood data has two reserved values: 1) autosampler, and 2) manual. The blood metadata should 121 be stored in a JSON sidecar file with a recording-<label> and a blood suffix, containing information about what 122 blood data are available (e.g. radioactivity in plasma and/or whole blood and parent compound). The blood JSON sidecar file 123 should be accompanied by a tabular TSV file with similar naming convention, containing all the values of the available blood 124 data. All blood data should be reported according to a unique reference time-scale in relation to a predefined time zero defined 125 by the PET data (Figure 1). The definition of time zero will be further explained below. 126

127 Specific PET-BIDS considerations

In order to construct the pet. json sidecar file which details the PET experiment metadata, a description of a common PET 128 experiment is necessary. In Figure 1 we present an overview of a common PET experiment (which includes the sampling of 129 blood data, including plasma, whole blood and metabolite data). The experiment is defined on a single time scale relative to a 130 predefined "time zero". Notably, "time zero" will often be defined as time of injection or scan start, and the injected dose, the 131 PET data, and blood data should optimally all be decay-corrected to time zero. However, because the time of injection does not 132 always coincide with scan start, PET data may not be decay-corrected to the time of injection. Whether the image has been 133 decay-corrected may be indicated in its metadata (using the fields: ImageDecayCorrected and ImageDecayCorrectionTime). 134 The flexibility in choice of time zero to either scan start or injection time was chosen to maximize ease of use and adoption 135 of PET-BIDS by the broadest possible spectrum of the PET community, due to potentially large differences in experimental 136 design between PET studies. For example, scan start and injection time may not always coincide, and due to radioactive decay 137 of the radiotracer, it is important to be aware of post-hoc decay correction. Importantly, the injected dose should always be 138 decay corrected to the time of injection. 139

Across the diverse set of radiotracers and experimental designs in PET, it will not always be possible to enter the required metadata following the guidelines for sharing of PET data⁸. For example, while the injected mass and specific radioactivity are required metadata according to the guidelines⁸, this is not possible to measure for certain radiotracers such as [¹⁸F]FDG due to its mass being too low to measure. In these cases, the values for injected mass and specific activity may be set to "n/a" to indicate missing values. We note that for required metadata, this is currently only valid for injected mass and specific activity, although future releases of the PET-BIDS specification may tackle further challenges in use cases that deviate from the current guidelines.

In the case of including MRI data with PET data, it is necessary to pay specific attention to the format the MR images are in, such as whether they have been unwarped to correct for gradient non-linearities. There is a specific metadata field in the BIDS

specification for MRI⁹ named *NonlinearGradientCorrection* which indicates this (please see Figure 3 for an example). The
 main reason for the importance of this is that the MRI needs to be corrected for nonlinear gradients causing spatial distortions
 in order to have the same shape as the accompanying PET scans for co-registration⁸. Therefore, it is required to specify
 whether the corresponding MR images have been corrected for gradient non-linearities, using the *NonLinearGradientCorrection*

¹⁵³ metadata field, if PET data are present.

In general, SI units must be used to describe the data such as "Bq/mL" for radioligand concentration, and seconds for time measurements relative to either scan start or injection time ("time zero").

156 Public PET-BIDS datasets

Several example datasets (with zero-byte, i.e., empty, NIfTI files) are publicly available in the BIDS-examples GitHub repository
 (https://github.com/bids-standard/bids-examples). The first two of these datasets (full version) are also
 openly available on OpenNeuro formatted using the PET-BIDS standard:

- The CIMBI Database [¹¹C]DASB PET Example Dataset consists of test and retest measurements from two individuals to measure serotonin transporter availability¹⁶. No blood data are available for this dataset. It was collected as a part of the CIMBI database (https://doi.org/10.18112/openneuro.ds001420.v1.0.1)¹⁷.
- The NRM2018 Grand Challenge dataset consists of baseline and intervention data from five individuals. No blood data are available for this dataset (https://doi.org/10.18112/openneuro.ds001705.v1.0.1)¹⁸.
- The CIMBI Database [¹¹C]CIMBI-36 PET Example Dataset consists of a single dynamic PET measurement of a pig to measure serotonin 2A receptor availability. Blood and metabolite data are available for this dataset. It was collected as a part of the CIMBI database (https://github.com/bids-standard/bids-examples/tree/master/pet001).
- The CIMBI Database [¹¹C]CIMBI-36 Intervention Example Dataset consists of a single dynamic PET measurement of a pig using bolus-infusion, and with a pharmacological ketanserin intervention during the scan. Blood and metabolite data are available for this dataset (https://github.com/bids-standard/bids-examples/tree/master/pet004).
- The CIMBI Database [¹¹C]AZ10419369 Visual Stimuli Example Dataset consists of two dynamic PET measurements of a single subject using combined PET/MRI. The first scan is a baseline scan, whereas the second scan includes a visual stimuli task during the scan. No blood data are available for this dataset. It was included in Hansen et al. 2020¹⁹ (https://github.com/bids-standard/bids-examples/tree/master/pet005).

177 Community tools for data sharing and analysis

178 The BIDS validator

Data curated into the PET-BIDS standard can be validated for BIDS compliance by using the "bids-validator"²⁰, a JavaScript 179 application checking for the completeness and consistency of the data. The BIDS validator runs locally as a command line 180 version (via Node.js), as a Docker container, or as a browser-based application (https://bids-standard.github. 181 io/bids-validator/). Using this important validation software, PET researchers are provided with feedback about 182 incompatibility errors as well as warnings if important pieces of metadata are missing. In addition to providing a version of 183 the validator as open source software, we are collaborating with the software developers of major PET analysis tools (PMOD, 184 SPM, MIAKAT and PETsurfer²¹) to facilitate rapid adoption and support of this format, and working with major PET centres 185 to help PET researchers convert their data into PET-BIDS format. Several software tools already exist to convert dicom files 186 and ECAT data into BIDS format, such as dcm2niix²² (https://github.com/rordenlab/dcm2niix), however, the 187 output may need *post-hoc* editing if required metadata are not available in the imaging header files. 188

189 The BIDS starter kit

- ¹⁹⁰ The BIDS starter kit is a tool to help researchers get started with the BIDS data structure (https://github.com/
- ¹⁹¹ bids-standard/bids-starter-kit). It consists of a collection of community-driven guides, tutorials, helper
- scripts, and wiki resources. A tutorial that describes how to create a BIDS-compatible PET data set has been provided on
- the starter-kit wiki (https://github.com/bids-standard/bids-starter-kit/wiki), and MATLAB (bids-starter-kit/wiki)
- matlab; https://github.com/bids-standard/bids-matlab) and Python (pybids; https://github.com/
- ¹⁹⁵ bids-standard/pybids) packages are also available to produce and/or work with PET sidecar JSON and TSV files.
- ¹⁹⁶ These packages are freely available on GitHub.

¹⁹⁷ Sharing of acquired PET data

According to the guidelines for the content and format of brain PET data⁸, acquired PET data are defined as PET data after 198 reconstruction into 3D or 4D frames. These data may be shared in repositories such as OpenNeuro (https://openneuro. 199 org), which is an open archive for analysis and sharing of public neuroimaging data spearheading the movement of best 200 practices within MRI, MEG, EEG, iEEG, ECoG, ASL and now PET²³. The OpenNeuro platform is the successor of OpenfMRI 201 (established in 2011, https://openfmri.org/), and the project enjoys relatively wide acceptance by the field and 202 capitalizes on the BIDS standard. It has been running for almost a decade and is one of the fastest growing image databases, 203 with about 12 new datasets being added per month. All datasets on OpenNeuro are validated for BIDS compliance prior to 204 upload. 205

²⁰⁶ Data analysis pipelines and sharing of derived PET data

²⁰⁷ BIDS also offers the possibility to build fully reproducible analysis workflows using the concept of BIDS applications²⁴. A

BIDS application is a software container capturing all the dependencies of a neuroimaging analysis pipeline (e.g., fMRIprep)

that takes a BIDS formatted data set as input. Each BIDS application has the same core set of command line arguments, making them easy to run and integrate into automated platforms, allowing for full computational reproducibility. Several open-source

initiatives for PET are currently under development to BIDS applications, including PETSurfer (https://surfer.nmr.

²¹² mgh.harvard.edu/fswiki/PetSurfer), APPIAN (https://github.com/APPIAN-PET/APPIAN) and

213 kinfitr (https://github.com/mathesong/kinfitr) providing tools to carry out preprocessing and/or pharma-

cokinetic modeling of PET data. We also highly recommend the great resources by the TURKU PET centre (http:

215 //www.turkupetcentre.net/), which have been providing thorough documentation and analysis tools for PET for

²¹⁶ several decades. The resulting outputs from BIDS applications can be shared using BIDS derivatives standards, describing

the outputs of common preprocessing pipelines and pharmacokinetic models. The specification for PET-BIDS derivatives

(BIDS Extension Proposal 23) is currently under development, and will capture data and metadata sufficient for a researcher to understand and reuse the output of a common PET analysis pipeline, including preprocessing and pharmacokinetic modeling.

220 Conclusion

The PET extension to BIDS specifies a structured way of storing PET data and metadata. BIDS is a community-driven project,

and the PET-BIDS specification was created in a joint effort made by the PET community (open and with community peer

review) aligning with the consensus guidelines for the content and format of PET brain data in publications and archives⁸.

PET-BIDS will make data sharing and software development easier, facilitate rapid development, adoption and application of

new tools and methods, and ultimately foster collaboration between researchers to combine data sets from different centers to achieve larger sample sizes and improved statistical power to test hypotheses.

227 **References**

- Bonte, F. J. Nuclear medicine pioneer citation, 1976: David e. kuhl, m.d. J. Nucl. Medicine 17, 518–519 (1976).
 https://jnm.snmjournals.org/content/17/6/518.full.pdf.
- 230 **2.** Phelps, M. E., Hoffman, E. J., Mullani, N. A. & Ter-Pogossian, M. M. Application of annihilation coincidence detection to 231 transaxial reconstruction tomography. *J. Nucl. Medicine* **16**, 210–224 (1975).
- **3.** Ter-Pogossian, M. M., Phelps, M. E., Hoffman, E. J. & Mullani, N. A. A positron-emission transaxial tomograph for nuclear imaging (pett). *Radiology* **114**, 89–98 (1975).
- 4. Boellaard, R. *et al.* FDG PET/CT: EANM procedure guidelines for tumour imaging: version 2.0. *European Journal of Nuclear Medicine and Molecular Imaging* 42, 328–354, 10.1007/s00259-014-2961-x (2015).
- 5. Cohen, A. D. & Klunk, W. E. Early detection of Alzheimer's disease using PiB and FDG PET. *Neurobiol. Dis.* 72, 117–122, https://doi.org/10.1016/j.nbd.2014.05.001 (2014). Special Issue: Metabolic disorders and neurodegeneration.
- 6. Gunn, R. N., Slifstein, M., Searle, G. E. & Price, J. C. Quantitative imaging of protein targets in the human brain with PET.
 Phys. Medicine Biol. 60, R363–R411, 10.1088/0031-9155/60/22/R363 (2015).
- 7. Innis, R. B. *et al.* Consensus nomenclature for in vivo imaging of reversibly binding radioligands. *J. Cereb. Blood Flow & Metab.* 27, 1533–1539 (2007).
- **8.** Knudsen, G. M. *et al.* Guidelines for the content and format of pet brain data in publications and archives: A consensus paper. *J. Cereb. Blood Flow & Metab.* 0271678X20905433 (2020).
- **9.** Gorgolewski, K. J. *et al.* The brain imaging data structure, a format for organizing and describing outputs of neuroimaging experiments. *Sci. Data* **3**, 10.1038/sdata.2016.44 (2016).

- 10. Niso, G. et al. MEG-BIDS, the brain imaging data structure extended to magnetoencephalography. Sci. data 5, 1–5 (2018).
- Pernet, C. R. *et al.* EEG-BIDS, an extension to the brain imaging data structure for electroencephalography. *Sci. Data* 6, 1–5 (2019).
- Holdgraf, C. *et al.* iEEG-BIDS, extending the brain imaging data structure specification to human intracranial electrophysiology. *Sci. data* 6, 1–6 (2019).
- 13. Moreau, C. A. *et al.* The genetics-bids extension: Easing the search for genetic data associated with human brain imaging.
 GigaScience 9, giaa104 (2020).
- 14. Wilkinson, M. D. *et al.* The fair guiding principles for scientific data management and stewardship. *Sci. Data* 3, 160018, 10.1038/sdata.2016.18 (2016).
- **15.** Heeman, F. *et al.* Optimized dual-time-window protocols for quantitative [18F]flutemetamol and [18F]florbetaben PET studies. *EJNMMI Res.* **9**, 1–14, 10.1186/s13550-019-0499-4 (2019).
- Frokjaer, V. G. *et al.* Role of serotonin transporter changes in depressive responses to sex-steroid hormone manipulation: A
 positron emission tomography study. *Biol. Psychiatry* 78, 534–543, 10.1016/j.biopsych.2015.04.015 (2015).
- 17. Knudsen, G. M. *et al.* The Center for Integrated Molecular Brain Imaging (Cimbi) database. *NeuroImage* 124, 1213–1219, 10.1016/j.neuroimage.2015.04.025 (2016).
- 18. Veronese, M. *et al.* Reproduciblity of findings in modern PET neuroimaging: insight from the NRM2018 Grand Challenge.
 J. Cereb. Blood Flow & Metab. 10.1177/0271678X211015101 (2021).
- 19. Hansen, H. D. *et al.* Visual stimuli induce serotonin release in occipital cortex: A simultaneous positron emission tomography/magnetic resonance imaging study. *Hum. Brain Mapp.* 41, 4753–4763, 10.1002/hbm.25156 (2020).
- 265 **20.** Blair, R. *et al.* bids-validator, 10.5281/zenodo.4711003 (2021).
- 266 21. Greve, D. N. *et al.* Cortical surface-based analysis reduces bias and variance in kinetic modeling of brain pet data.
 267 *Neuroimage* 92, 225–236 (2014).
- 268 22. Li, X., Morgan, P. S., Ashburner, J., Smith, J. & Rorden, C. The first step for neuroimaging data analysis: Dicom to nifti conversion. *J. Neurosci. Methods* 264, 47–56, https://doi.org/10.1016/j.jneumeth.2016.03.001 (2016).
- **23.** Gorgolewski, K., Esteban, O., Schaefer, G., Wandell, B. & Poldrack, R. Openneuro—a free online platform for sharing and analysis of neuroimaging data. *Organ. for human brain mapping. Vancouver, Can.* **1677** (2017).
- 272 24. Gorgolewski, K. J. *et al.* BIDS apps: Improving ease of use, accessibility, and reproducibility of neuroimaging data analysis methods. *PLOS Comput. Biol.* 13, e1005209, 10.1371/journal.pcbi.1005209 (2017).

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283 Author contributions statement

MG and MN: Conception and design of the specification, moderating community interactions, coding of the bids-validator
extension, preparation of datasets and examples, writing the manuscript. GJM: critical review and editing of the specification,
coding of PET-BIDS tools (KinFitr), final review of the version submitted. HDH, AT, GS, GR, MV, AG, MY, MT, TF, AG, HB,
AR, JRD, TB, FF, CJM, KJG, RWB, SA, RG, TS, GN, CP, CP, RO, JG, REC, GMK, RBI: critically reviewed the specification
and final approval of the version submitted.

Competing interests

²⁹⁰ The authors declare no competing interests.

Figures & Tables

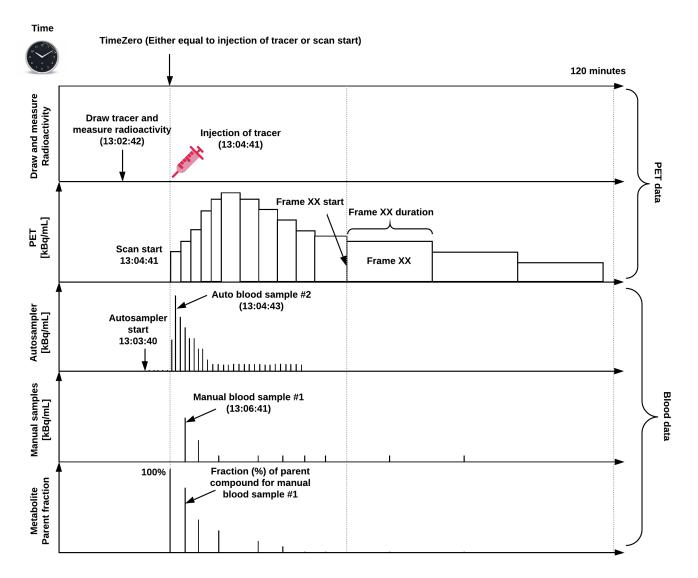


Figure 1. Overview of a common PET experiment, including blood measurements, and defined on a common time scale. Note, "time zero" can either be defined as time of injection or scan start, and all the PET and blood data should be decay-corrected to this time point.

```
sub-<participant_label>/
ses-<session_label>/]
pet/
sub-<participant_label>[_ses-<session_label>][_task-<task_label>]...
...[_trc-<label>][_rec-<label>][_run-<index>]_pet.nii[.gz]
sub-<participant_label>[_ses-<session_label>][_task-<task_label>]...
...[_trc-<label>][_rec-<label>][_run-<index>]_pet.json
```

Figure 2. The template for the naming convention of the PET-BIDS file structure. The naming convention follows a key-value pair defining various steps of the acquisition, including the session, task, acquisition, reconstruction, and run. The main imaging data file has a _pet suffix stored in the NIfTI format (*.nii). The imaging data are accompanied by a JSON sidecar file containing all the necessary metadata needed to understand the PET data.

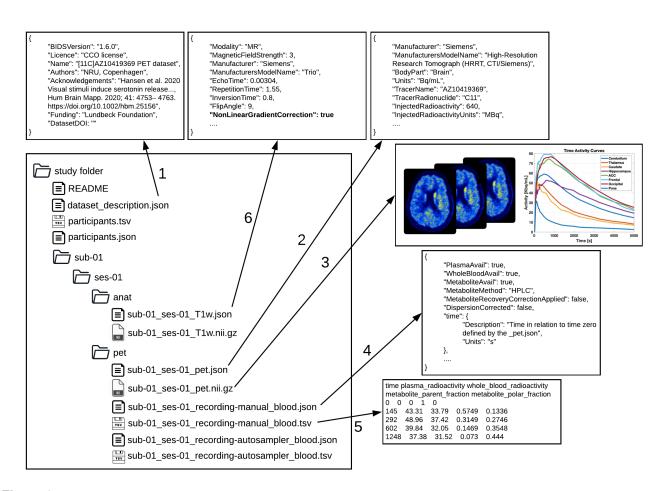


Figure 3. Exemplary PET-BIDS dataset with a dataset description, including adequate acknowledgements (1), previews of PET files (2,3), including blood (4,5) and MRI data (6). The left side shows a directory tree of a common PET-BIDS dataset, with files in the root directory describing the dataset (README and data_description.json), a file with participant-specific information (participants.tsv), and a JSON sidecar file describing the metadata needed to understand the corresponding TSV file. Next to the files in the root directory are subject directories named sub-<label> for each study participant. In the subject directory lies all acquired data divided into modalities (anat and pet, for the PET and structural MRI, respectively). The content of the pet directory are displayed in the right side of the figure, including the metadata of the raw PET data (2), and the associated imaging data (3). The metadata for the blood data acquired using manual sampling is stored in a JSON sidecar file (4), with the corresponding blood specified in the TSV file (5). The columns in the TSV file contain 1) time, 2) plasma radioactivity, 3) whole blood radioactivity, 4) metabolite parent fraction, and 5) metabolite polar fraction. Blood data acquired using an autosampler is also available following a similar structure as (3) and (4). The PET data may be accompanied with MRI data for co-registration and region definition (6). In this case, it is required to specify if the MRI data has been corrected for gradient non-linearities (*NonLinearGradientCorrection*) to allow for correct co-registration with the PET data.